

Land use Land Cover Change Detection using K-means Clustering and Maximum Likelihood Classification Method in the Javadi Hills, Tamil Nadu, India



M. Sam Navin, L. Agilandeewari

Abstract: Land use/Land cover (LU/LC) change analysis is the present-day challenging task for the researchers in defining the environmental change across the world in the field of remote sensing and GIS (Geographic Information System). This paper analyzes the LU/LC changes between the years 2009 and 2019 in the region of Javadi Hills located in Tamil Nadu, India. Images from the Indian remote sensing satellite Resourcesat-1 LISS III and American earth observation satellite Landsat-8 were used for analyzing the LU/LC change for the study area. In this work, the classification was performed by using the hybrid approach of unsupervised and supervised classifiers. The classified LU/LC map for the study area defines forest and non-forest covered region. The key objective of this work was to identify the percentage of LU/LC change occurred in our study area for the years 2009 to 2014 and 2014 to 2019. Observing and examining the changes occurred in the study area provides a clear view to the land resources management to take effective measures in protecting the environment.

Keywords: Land Use/ Land Cover, Remote Sensing, GIS (Geographic Information System), Supervised and Unsupervised Classifiers, Accuracy Assessment, Change Analysis and Land Resource Management

I. INTRODUCTION

Land Use/Land Cover (LU/LC) change plays a crucial role in understanding the impact on the global environment. The LU/LC change detection problem has been sorted out and performed all over the world. LU/LC change analysis is active research in remote sensing environments due to several problems happening in the land surface throughout the world. Few of the problems are deforestation, increase in population growth, and industrialization. The geological structure, slope, altitudes, socio-economic factors, and other ecological conditions determine the LU/LC pattern. The forest survey report states that India had ranked the eighth position across the globe in the year 2017 for achieving the maximum increase of the annual forest area [1]. LU/LC

change analysis was said as a significant key for measuring the changes across the globe for different spatiotemporal scales. Remote Sensing and GIS (Geographic Information System) helps in categorizing and mapping the LU/LC change for different regions with various technologies. The LU/LC change pattern should be recognized clearly for better development and management for natural resources. Various methods and procedures have been familiarized with analyzing the LU/LC changes. With the support of different remote sensing and the GIS software, the supervised, unsupervised and fuzzy classification was considered as an extensively applied image classification method for real-time data [2]. Defining and analyzing the LU/LC change over the different periods and generating the better classification accuracy had become the trending part of research in the field of remote sensing. The LU/LC change analysis has been attaining more recognition for worldwide researchers [3]. The image processing methods applied for the satellite data provides dynamic information about the LU/LC change information. For monitoring the variations that occur on the earth's surface, the remote sensing is considered as an efficient and the most reliable environment for the researchers. The analysis of the LU/LC change information provides the advantage for the urban planners to make the appropriate decision in protecting the land resource management [4]. For classifying the satellite images, the different classification techniques were used by the remote sensing researchers. Among those classification methods, the supervised model helps in classifying the satellite image through different pixels by training the image with the reference data for the specified region. Most of the researchers state that the supervised classification technique generally simplifies the precise class descriptions and determines better classification accuracy. The accuracy report of the given study area was generated by comparing the classified data with the reference data. The contingency matrix was evaluated along with kappa statistics, producer, user and the overall accuracy for each classified class [5]. The meticulous process of LU/LC change detection helps in gathering the detailed information about the change of land cover area for different time periods. Image differencing, PCA (Principal Component Analysis) and the post-classification map comparison are said to be the commonly used techniques for analyzing the satellite image [6]. In the field of remote sensing, the LU/LC classes are classified and the LU/LC change was analyzed by using the classified map of different time periods.

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The investigation of both spatial and temporal LU/LC changes helps in processing and managing the natural resources [7]. For monitoring the natural resources and for mapping the forest cover area the satellite data were used across the world. For observing the large areas, the satellite data were acquired, and it helps in identifying the LU/LC change for the specific region for different periods [8].

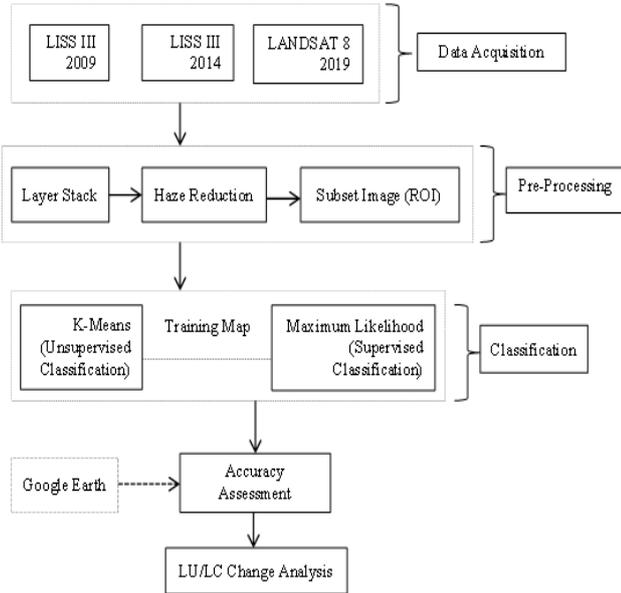


Fig. 1. LU/LC Change Detection Analysis Workflow for the Javadi Hills

The main objective of this paper was to analyze LU/LC changes between the years 2009 and 2019 in the region of Javadi Hills. Fig. 1 describes the flow of LU/LC change detection analysis for our study area. However, the LU/LC change detection analysis in the Javadi hills located in the Tiruvannamalai district has not been clearly studied and demonstrated over many years. Tiruvannamalai district has earned major importance over the forest cover areas. The main focus of this paper was to assist the land resource management to take the essential steps over the forest growth and to resist external source from the deforestation.

II. MATERIALS AND METHODS

A. Study Area

The present study area was focused in the region of Javadi Hills, Bheemakulam, located in the area of the Eastern Ghats which falls across the region of Tiruvannamalai district, Tamil Nadu, India. The determined portion of the entire district is sheltered with the forest cover where the study area is located near to the Alangayam reserved forest. The Javadi hills lie between the coordinates of between 78°48'22.63" E to 78°51'05.51" E longitude and 12°33'48.70" N to 12°36'12.90" N latitude. The thematic representation of our study area is shown in Fig. 2. A Javadi hill is positioned at an altitude averaging among 3,600–3,800 feet (1100 to 1500 m). The tress in this hilly region produces a variety of forest products and has many homeopathic and fruit-bearing trees. Some of them are castor oil plant, millettia pinnata, smilax regelii etc.

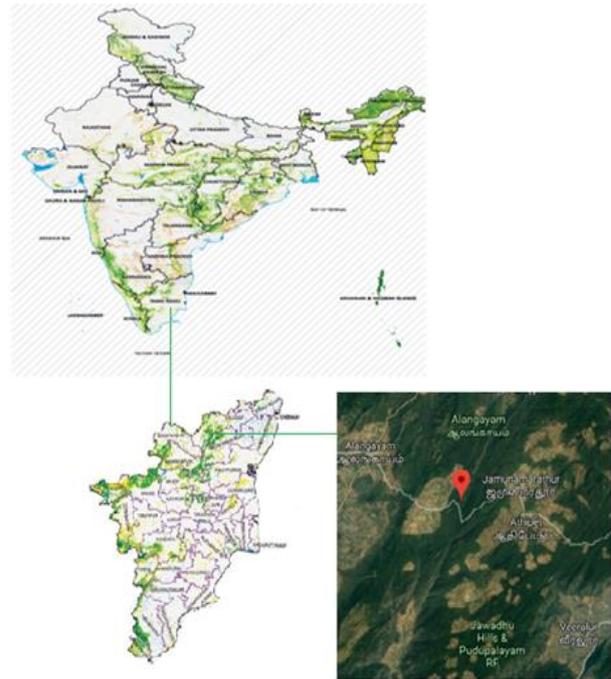


Fig. 2. Location of the Study Area – Javadi Hills

B. Data Acquisition

The data for this study area covers the LISS-III multispectral images, captured on 19th October 2009, 07th April 2019 and the Landsat 8 OLI- TIRS image captured on 23rd April 2019. Table I displays the characteristics and source of the satellite images. The national and state-level statistics of the forest cover maps are collected from the forest survey of India. Google earth images are used as the reference for the satellite images.

Table- I: Characteristics and Source of the Satellite Images

Geospatial Input Data	Path/row	Resolution (m)	Date	Source
Indian remote sensing satellite Resources at-1 LISS III	101/064	23.5	19 October 2009, 20 April 2014	Bhuvan Indian Geo-Platform of ISRO www.bhuvan.com
American earth observation satellite Landsat-8	143/51	30	23 April 2019	U.S. Geological Survey https://earthexplorer.usgs.gov/

C. Satellite Image Pre-processing and Classification

Pre-processing of the acquired satellite images is considered as an essential procedure before classification. Layer stacking is used for combining all the required bands of the satellite image into multispectral image.

The haze reduction method is used for removing the atmospheric effects on the satellite images. The pre-processing of satellite images helps in removing the noise and other cloud effects. The region of interest (ROI) is acquired from the pre-processed images and then processed for further analysis [4]. In this paper we used layer stacking, atmospheric and radiometric correction for improving the quality and visibility of the satellite images. LU/LC classification was performed for the given study area after pre-processing. The ROI image was selected from the satellite data and processed for classification. For extracting the thematic information from the satellite image, the image classification was performed. The supervised and unsupervised classification technique was performed for classifying the pre-processed satellite images. The hybrid approach helps in attaining better accuracy. We used K-means unsupervised classification method along with supervised maximum likelihood classification to classify the pre-processed satellite images for our study area.

Table- II: LU/LC Classes and their Descriptions for Javadi Hills

LU/LC Class	Description
Forest	Area covered with trees, bushes and other variety of shrubs.
Non-Forest	It contains agricultural fields, vegetation and other barren lands.

Among different supervised classifiers, the maximum likelihood classification was considered as the well-known technique which had been used extensively for classifying the pre-processed satellite image. The maximum likelihood classifier determines each pixel of the satellite image should belong to the specific class for conveying the thematic information. The maximum likelihood classifier or Bayesian decision rule assumes the statistics for each LU/LC class in the acquired satellite images are normally distributed, and it helps in calculating the probability that the each pixel belongs to some specific LU/LC class. [9] – [12]. K-Means was the well-known unsupervised classification method that helps in minimizing the squared error function and solves the cluster problems. K- Means was the fast and robust method that gives the finest result when the data gets separated or distributed from each other [13] [14].

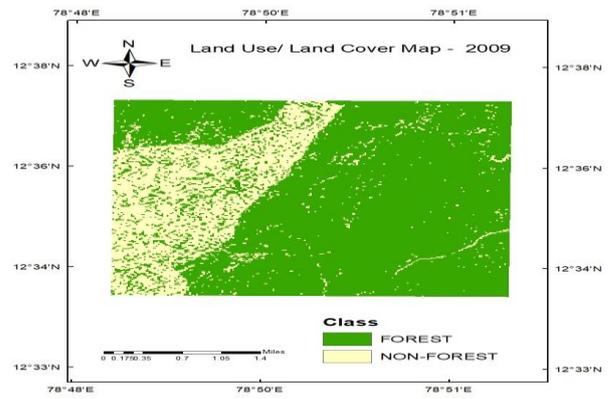


Fig. 3. Land Use/ Land Cover Map – 2009

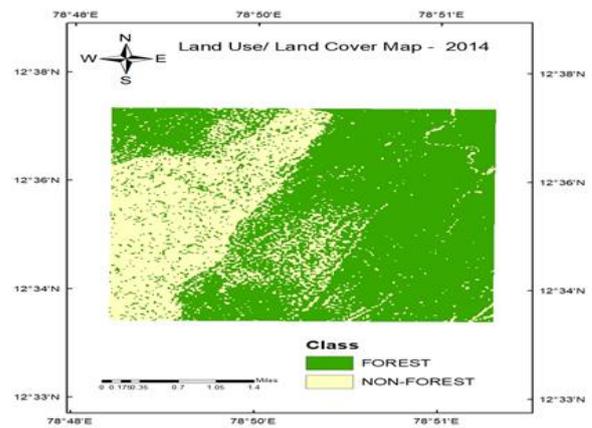


Fig. 4. Land Use/ Land Cover Map – 2014

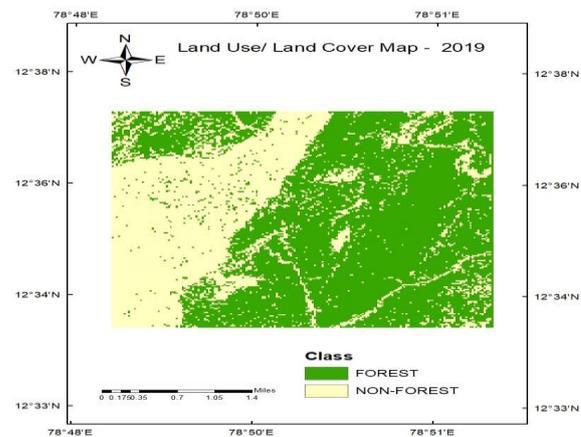


Fig. 5. Land Use/ Land Cover Map – 2019

The multispectral image for the given study area was classified as forest and non-forest cover region and it was shown in Table II. By using the result of the unsupervised K-means method, the supervised maximum likelihood classification was trained and processed. The classification results were shown in Fig. 3, 4 and 5. The result produces better classification accuracy by using this hybrid approach. The key idea of this paper was to identify the forest and non-forest cover region of our study area.

III. RESULT AND DISCUSSION

This work involved the analysis of LU/LC changes that occurred in the Javadi Hills during 2009, 2014 and 2019. Experimentation was conducted on satellite images for 2009, 2014 and 2019 for analyzing the LU/LC changes in the forest and non-forest covered regions of Javadi Hills. All experiments were conducted using RStudio and geospatial processing software like ArcGIS and Google Earth Engine on Intel Xeon processor 2.90 GHz CPU along with 128 GB RAM in Windows 10 (64 bit) environment.

A. Accuracy Assessment

An accuracy assessment should be done for the better recognition of the classified images. The accuracy was calculated by comparing the classification results with the reference data [15] - [18]. The hybrid approach of K- Means and Maximum Likelihood Classification method was performed in this work and the 256 random sampling points were collected for each identified LU/LC class to assess the accuracy. The reference points obtained were observed with the Google earth images which were acquired for the consistent periods of 19th October 2009, 20th April 2014 and 23rd April 2019. The confidence of the result was determined by the accuracy assessment. The user, producer and overall accuracy report are generated along with the result of kappa statistics. The accuracy assessment of the classified satellite images for the year 2009, 2014 and 2019 are presented in Table III. For each class, the overall accuracy was attained and they were as follows: 95.70% for the year 2009, 91.02% for the year 2014 and 96.48% for the year 2019. The kappa statics was obtained and the values are as follows: 0.8982 for the year 2009, 0.8014 for the year 2014 and 0.9196 for the year 2019. The accuracy results demonstrate the good sign-in of the classified image concerning the Google earth image.

Table- III: Accuracy Assessment of the classified images for the year 2009, 2014 and 2019

LU/LC Class	2009		2014		2019	
	UA (%)	PA (%)	UA (%)	PA (%)	UA (%)	PA (%)
F	96.11	97.74	93.98	92.31	98.83	96.02
NF	94.74	91.14	85.56	88.51	91.76	97.50
OA (%)	95.70		91.02		96.48	
KS	0.8982		0.8014		0.9196	

F – Forest, NF – Non-Forest, OA – Overall Accuracy, KS- Kappa Statistics, UA- User Accuracy, PA- Producer Accuracy

B. LU/LC Change Analysis

Due to the expansion of the human population and the industrial growth and other anthropogenic drivers, the LU/LC change was recognized as a critical part of research in the field of remote sensing [19] [20].

Table- IV: LU/LC CHANGE (2009 – 2014)

LU/LC CHANGE	Area (ha)	Percentage (%)
Forest – Forest	1902.07462	62%
Forest -- Non-Forest	377.457415	12%
Non-Forest – Forest	122.215699	4%
Non-Forest -- Non-Forest	662.989017	22%

Over the many years, the land cover of the Javadi hills especially in forest had been used more significantly. Since, there is a need for information about the recent LU/LC changes that occurred in forest-covered areas of the Javadi hills, this work helps in providing the information to the land resource management to take necessary actions to prevent land resources in the future. LU/LC change analysis for the year 2009 to 2014 and 2014 to 2019 was performed and the results are presented in Tables IV and V.

Table- V: LU/LC CHANGE (2014 – 2019)

LU/LC CHANGE	Area (ha)	Percentage (%)
Forest – Forest	1645.643073	54 %
Forest -- Non-Forest	371.576298	12%
Non-Forest – Forest	180.061045	6%
Non-Forest -- Non-Forest	848.630794	28 %

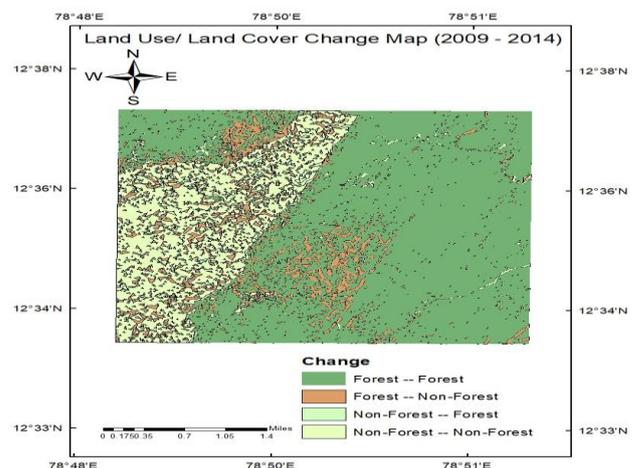


Fig. 6. LU/LC Change Map (2009 – 2014)

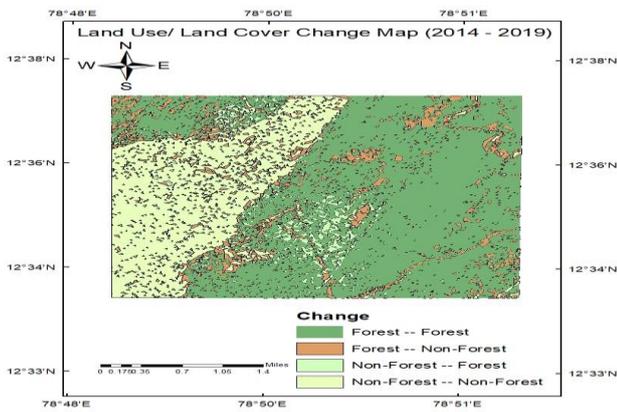


Fig. 7. LU/LC Change Map (2009 – 2014)

The study area was categorized as forest and non-forest cover region. From 2009 to 2014, 377.457415 ha of forest cover were converted to non-forest cover, 122.215699 ha of non-forest were converted to forest cover, 1902.07462 ha of forest cover and 662.989017 ha of non-forest cover remains under same LU/LC categories. From 2014 to 2019, 371.576298 ha of forest cover were converted to non-forest cover, 180.061045 ha of non-forest were converted to forest cover, 1645.643073 ha of forest cover and 848.630794 ha of non-forest cover remains under same LU/LC categories. The LU/LC change map for the different periods of 2009 to 2014 and 2014 to 2019 are shown in Fig. 6 and 7.

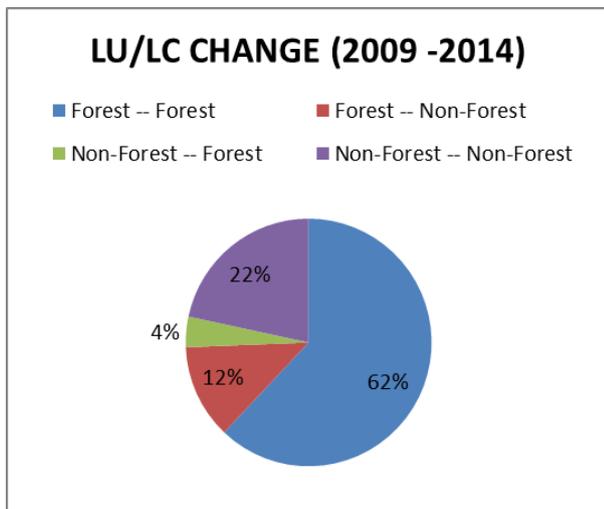


Fig. 8. Comparison of LU/LC Change from 2009 - 2014

The main goal of this work was to identify the percentage of LU/LC change that happened in the given study area. The result of this study shows that, for the year 2009 to 2014, 12% of forest cover was changed to non-forest cover, 4% of the non-forest cover was changed to forest cover, and 62% of forest cover and 22% of non-forest cover remains same as before. For the year 2014 to 2019, 6% of the non-forest cover is changed to forest cover, 54% of forest cover and 28% of non-forest cover remains the same as before and 12% of forest cover is changed to non-forest cover. The comparison chart is shown in Fig. 8 and 9.

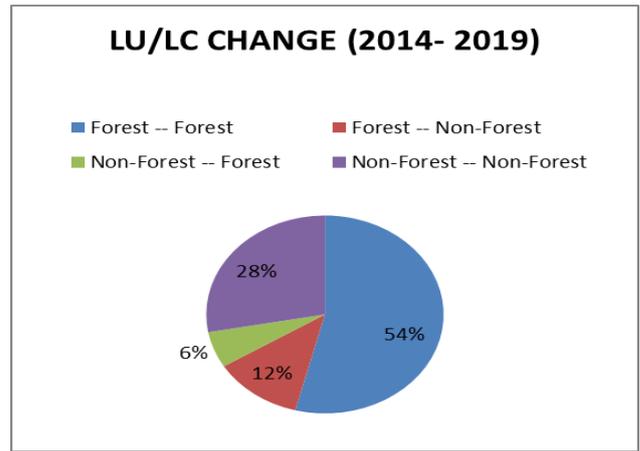


Fig. 9. Comparison of LU/LC Change from 2014 – 2019

IV. CONCLUSION

LU/LC change reveals the major activities of humans on the environment and the natural resources. The satellite data for the years 2009, 2014 and 2019 had been pre-processed and classified into the forest and non-forest covered region. This work provides the advantage of using the hybrid classification technique of supervised and non-supervised classifiers which provides the enhanced accuracy results and hence helps in the further process of LU/LC change analysis for our study area. The utmost aim of this work was to identify the significant amount of LU/LC change that had been happened in the given study area for different five years span of 2009 to 2014 and 2014 to 2019. Apart from forest to forest and non-forest to non-forest, the results show that 12% of area has been changed from forest to non-forest for both the periods (2009 to 2014 and 2014 to 2019) and 4% of area had been changed from non-forest to forests for the year 2009 to 2014 and 6% of area had been changed from non-forest to forests for the year 2014 to 2019. The major changes that occurred in the study area help the decision-makers and other urban planners to make necessary actions over land resource management. This work provides the analysis that the deforestation is the main cause and it should be controlled and the government should make awareness to every human about the importance of having forest cover areas in the hilly region. This work on LU/LC change analysis in the Javadi hills was performed to initiate further researchers in finding the LU/LC change prediction for our study area.

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